

# Acyclic and Star Colorings of Joins of Graphs and an Algorithm for Cographs

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# Subgraphs and Induced Subgraphs

$$G = \{V, E\}$$



## Subgraph

$G' = \{V', E'\}$  where  $V' \subseteq V$  and  $E' \subseteq E$



## Induced Subgraph

$G' = \{V', E'\}$  where  $V' \subseteq V$  and  $E'$  consists of all edges with both endpoints in  $V'$

(vertex-induced subgraph)



# Outline

## Restricted Coloring Problems

- Acyclic coloring

- Star Coloring

## Applications to Hessian Computation

- Star Coloring – Direct Hessian Computation

- Acyclic Coloring – Indirect Hessian Computation

## Acyclic and Star Coloring Joins of Graphs

- The Join Operation  $*$

- Main Theorem

- The Binary Case

## Cographs

- Definitions and Characterizations

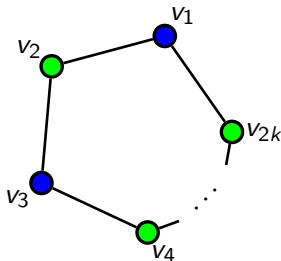
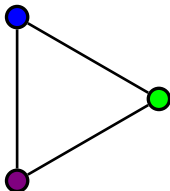
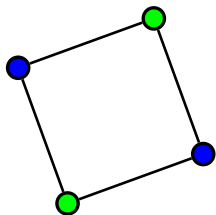
- Algorithms for Acyclic and Star Coloring

- Example

## Future Work

# Coloring

proper vertex coloring

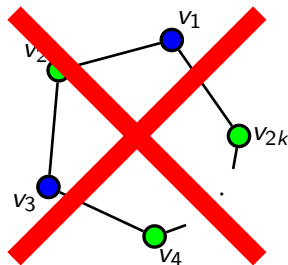
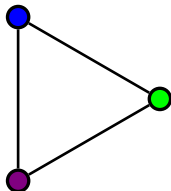
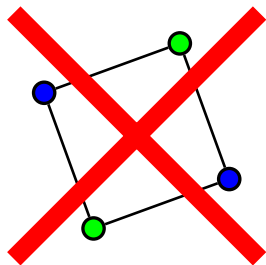


chromatic number

$\chi(G)$

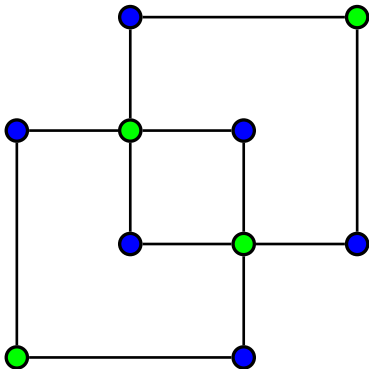
# Acyclic Coloring

proper vertex coloring without bichromatic cycles



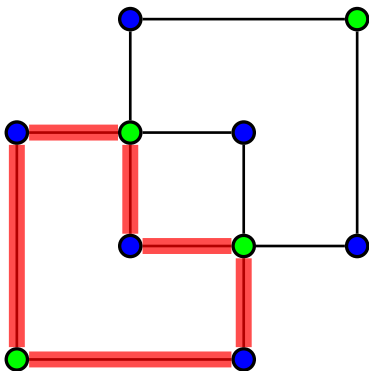
acyclic chromatic number  $\chi_a(G) \geq \chi(G)$

## Acyclic Coloring – No Bichromatic Cycles



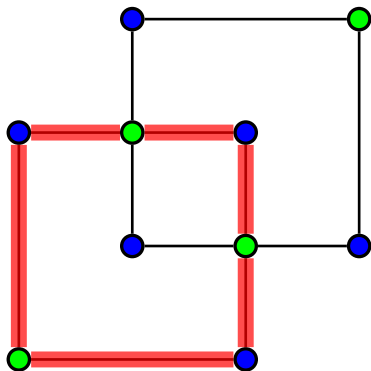


## Acyclic Coloring – No Bichromatic Cycles

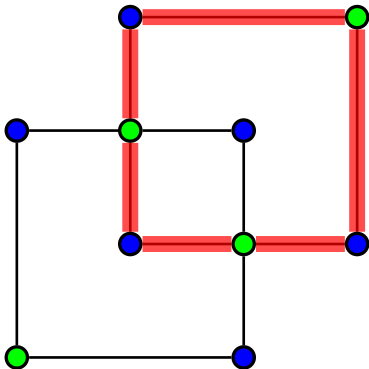




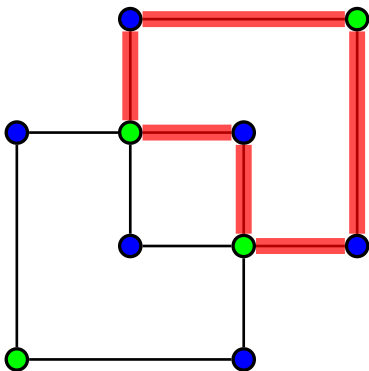
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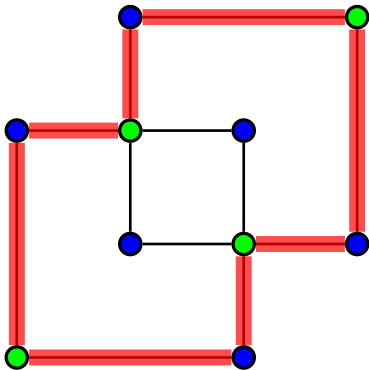
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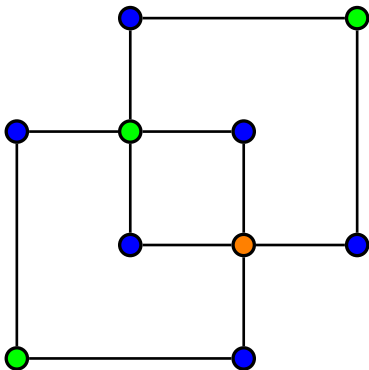
## Acyclic Coloring – No Bichromatic Cycles



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## Acyclic Coloring – No Bichromatic Cycles



$$\chi_a(G) = 3$$

## Acyclic Coloring – Definitions

A proper vertex coloring such that ...

### Original Definition

... every (even) cycle uses  $\geq 3$  colors.

# Acyclic Coloring – Definitions

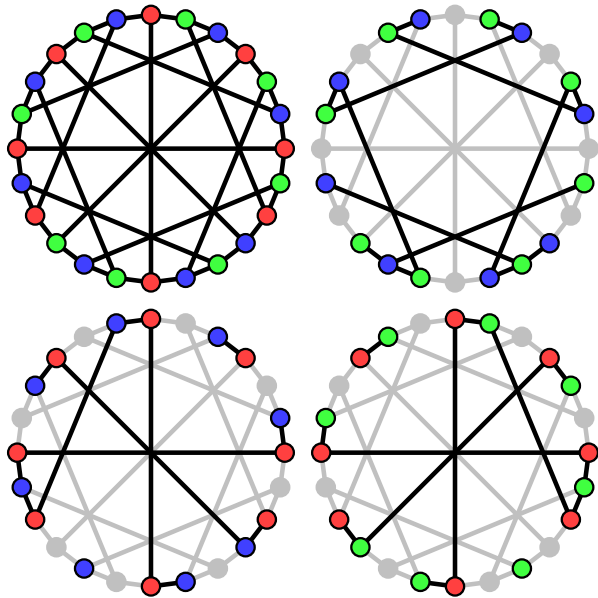
A proper vertex coloring such that ...

## Original Definition

... every (even) cycle uses  $\geq 3$  colors.

## Bichromatic Induced Subgraphs

... the subgraph induced by any two color classes is a disjoint collection of trees (a *forest*).



credit: Claudio Rocchini (GNU Free Documentation License)

[http://commons.wikimedia.org/wiki/File:Acyclic\\_coloring.svg](http://commons.wikimedia.org/wiki/File:Acyclic_coloring.svg)



# Acyclic Coloring – Algorithms

## Chordal Graphs

Solvable in linear time for this class of graphs.

(In fact, every coloring of a chordal graph is also an acyclic coloring.)

(Gebremedhin, Pothen, Tarafdar, & Walther 2009).

# Acyclic Coloring – Algorithms

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## Bounded maximum degree $\Delta(G)$

- ▶ If  $\Delta(G) \leq 3$ , then  $G$  can be acyclically colored using 4 colors or fewer in linear time (Skulrattanakulchai 2004).
- ▶ If  $\Delta(G) \leq 5$ , then  $G$  can be acyclically colored using 9 colors or fewer in linear time (Fertin & Raspaud 2008).

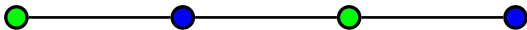
# Acyclic Coloring – Complexity

**NP**-Complete to determine whether  $\chi_a(G) \leq 3$   
(Kostochka 1978)

**NP**-hard even when restricted to bipartite graphs  
(Coleman & Cai 1986)

# Coloring

proper vertex coloring



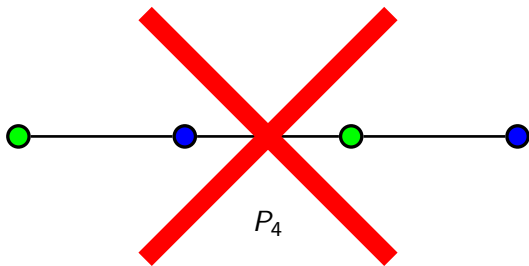
$P_4$

chromatic number

$\chi(G)$

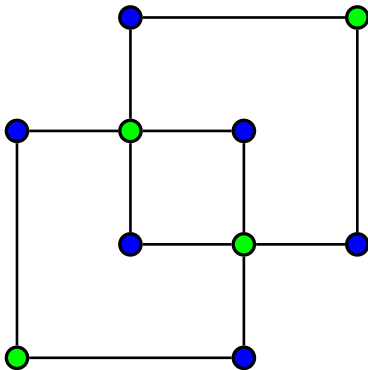
# Star Coloring

proper vertex coloring with no bichromatic  $P_4$   
(That's every  $P_4$ , not just the induced ones)

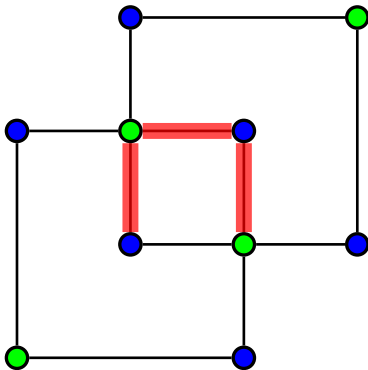


star chromatic number  $\chi_s(G) \geq \chi_a(G) \geq \chi(G)$   
(A bichromatic cycle implies a bichromatic  $P_4$ )

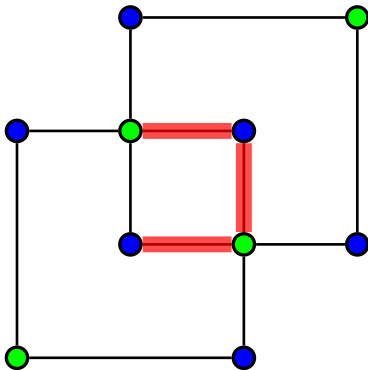
## Star Coloring



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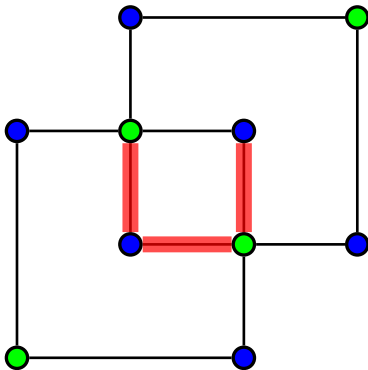


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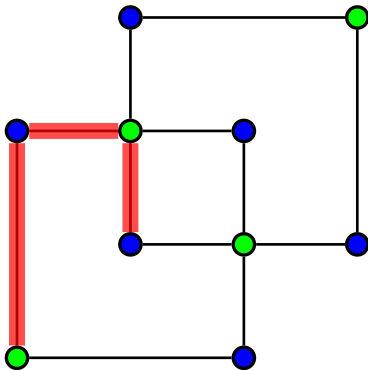




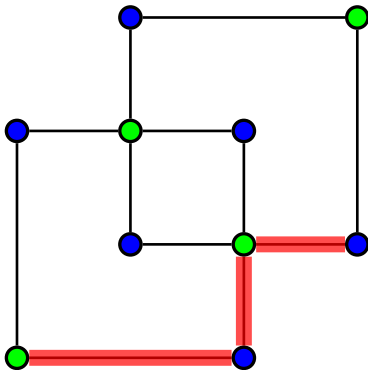
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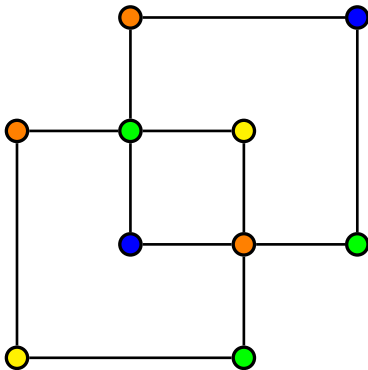
## Star Coloring



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## Star Coloring



$$\chi_s(G) = 4 \quad (\text{I think})$$

# Star Coloring – Definitions

A proper vertex coloring such that ...

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... every  $P_4$  uses  $\geq 3$  colors.

# Star Coloring – Definitions

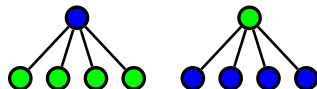
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## Original Definition

... every  $P_4$  uses  $\geq 3$  colors.

## Bichromatic Induced Subgraphs

... the subgraph induced by any two color classes is a disjoint collection of *stars*.



## Star Coloring – Complexity

**NP**-Complete to determine whether  $\chi_s(G) \leq 3$  for planar bipartite graphs

(Albertson, Chappell, Kierstead, Kündgen, & Ramamurthi 2004)

**NP**-hard when restricted to bipartite graphs

(Coleman & Moré 1984)

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(Coleman & Moré 1984)

## Open Problem

For a **split graph**  $G$ ,  $\chi_s(G)$  is either  $\omega(G)$  or  $\omega(G) + 1$ .

What is the complexity of determining this?



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- The Join Operation \*

- Main Theorem

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## Cographs

- Definitions and Characterizations

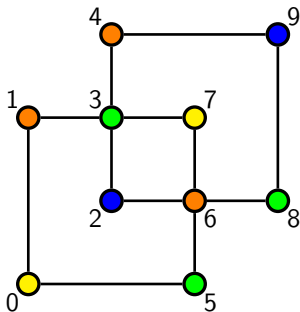
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## Future Work

# Star Coloring – Direct Hessian Computation

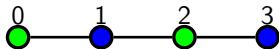
$h_{00}$	$h_{01}$				$h_{05}$						0	0	0	1
$h_{10}$	$h_{11}$										0	1	0	0
											1	0	0	0
			$h_{13}$								0	0	1	0
	$h_{31}$	$h_{22}$	$h_{23}$			$h_{26}$					0	1	0	0
		$h_{32}$	$h_{33}$	$h_{34}$			$h_{37}$				0	0	1	0
			$h_{43}$	$h_{44}$							0	0	1	0
$h_{50}$					$h_{55}$	$h_{56}$					0	0	1	0
		$h_{62}$			$h_{65}$	$h_{66}$	$h_{67}$	$h_{68}$			0	1	0	0
			$h_{73}$			$h_{76}$	$h_{77}$				0	0	0	1
						$h_{86}$		$h_{88}$	$h_{89}$		0	0	1	0
				$h_{94}$				$h_{98}$	$h_{99}$		1	0	0	0



	$h_{01}$	$h_{05}$	$h_{00}$
	$h_{11}$	$h_{13}$	$h_{10}$
$h_{22}$	$h_{26}$	$h_{23}$	
$h_{32}$	$h_{31} + h_{34}$	$h_{33}$	$h_{37}$
$h_{49}$	$h_{44}$	$h_{43}$	
	$h_{56}$	$h_{55}$	$h_{50}$
$h_{62}$	$h_{66}$	$h_{65} + h_{68}$	$h_{67}$
	$h_{76}$	$h_{73}$	$h_{77}$
$h_{89}$	$h_{86}$	$h_{88}$	
$h_{99}$	$h_{94}$	$h_{98}$	

# Star Coloring – Direct Hessian Computation

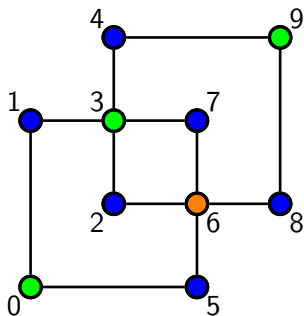
$h_{00}$	$h_{01}$		
$h_{10}$	$h_{11}$	$h_{12}$	
	$h_{21}$	$h_{22}$	$h_{23}$
		$h_{32}$	$h_{33}$



$h_{00}$	$h_{01}$
$h_{10} + h_{12}$	$h_{11}$
$h_{22}$	$h_{21} + h_{23}$
$h_{32}$	$h_{33}$

## Acyclic Coloring – Indirect Hessian Computation

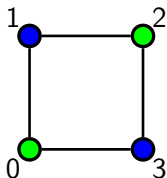
$h_{00}$	$h_{01}$		$h_{05}$							0	0	1
$h_{10}$	$h_{11}$	$h_{13}$								1	0	0
	$h_{22}$	$h_{23}$			$h_{26}$					1	0	0
	$h_{31}$	$h_{32}$	$h_{33}$	$h_{34}$		$h_{37}$				0	0	1
		$h_{43}$	$h_{44}$					$h_{49}$		1	0	0
$h_{50}$				$h_{55}$	$h_{56}$					1	0	0
	$h_{62}$			$h_{65}$	$h_{66}$	$h_{67}$	$h_{68}$			0	1	0
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$h_{01} + h_{05}$		$h_{00}$
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$h_{22}$	$h_{26}$	$h_{23}$
$h_{31} + h_{32} + h_{34} + h_{37}$		$h_{33}$
$h_{44}$		$h_{43} + h_{49}$
$h_{55}$	$h_{56}$	$h_{50}$
$h_{62} + h_{65} + h_{67} + h_{68}$	$h_{66}$	
$h_{77}$	$h_{76}$	$h_{73}$
$h_{88}$	$h_{86}$	$h_{89}$
$h_{94} + h_{98}$		$h_{99}$

# Acyclic Coloring – Indirect Hessian Computation

$$\begin{bmatrix} h_{00} & h_{01} & h_{02} & h_{03} \\ h_{10} & h_{11} & h_{21} & h_{13} \\ h_{20} & h_{12} & h_{22} & h_{23} \\ h_{30} & h_{31} & h_{32} & h_{33} \end{bmatrix}$$



$$\begin{bmatrix} h_{01} + h_{03} & h_{00} \\ h_{11} & h_{10} + h_{21} \\ h_{12} + h_{23} & h_{22} \\ h_{33} & h_{30} + h_{32} \end{bmatrix}$$

# Coloring for Efficient Derivative Matrix Computation

## Hessian Computation

Star Coloring: Direct computation

Acyclic coloring: Indirect (substitution) computation

## Jacobian Computation

Distance-2 Coloring: Direct, 1-dimensional computation

Star Bicoloring: Direct, 2-dimensional computation

Acyclic Bicoloring: Indirect (substitution), 2-dimensional computation

A. Gebremedhin, F. Manne, A. Pothen, **What Color Is Your Jacobian?**  
**Graph Coloring for Computing Derivatives**, *SIAM Review* **47**:4 (2005).

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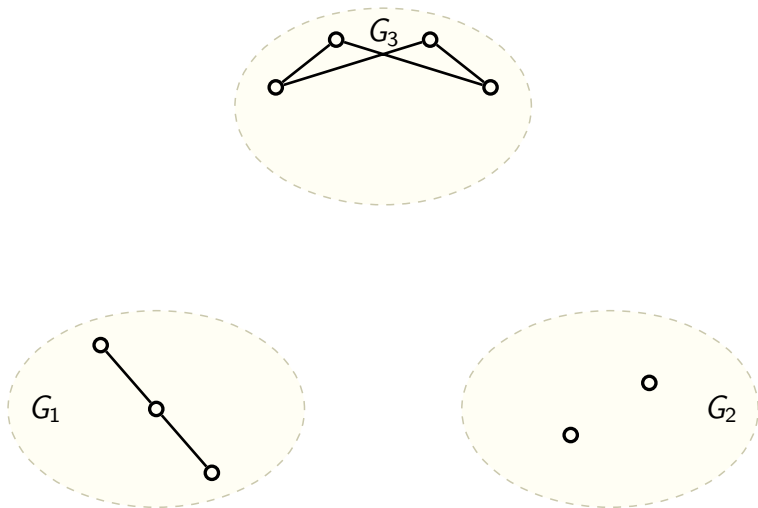
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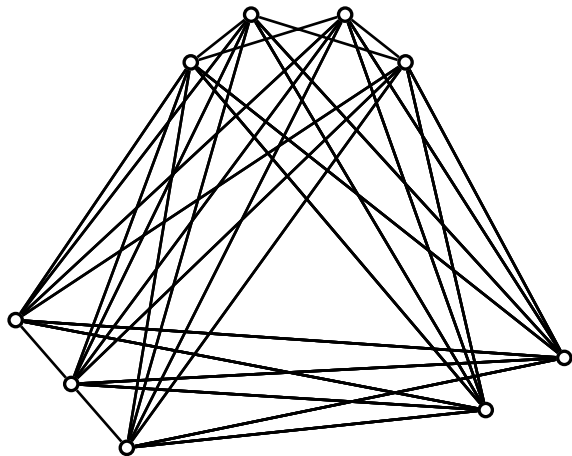
## Future Work

## The Join Operation \*





## The Join Operation $*$



$$\bigotimes_{i=1}^3 G_i$$

# The Main Theorem

## Theorem

Let  $\{G_i = (V_i, E_i)\}_{i \in \mathcal{I}}$  be a finite collection of graphs. Then

$$(i) \quad \chi_a \left( \bigotimes_{i \in \mathcal{I}} G_i \right) = \sum_{i \in \mathcal{I}} \chi_a(G_i) + \min_{j \in \mathcal{I}} \left\{ \sum_{i \in \mathcal{I}, i \neq j} (|V_i| - \chi_a(G_i)) \right\};$$

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$$(ii) \quad \chi_s \left( \bigotimes_{i \in \mathcal{I}} G_i \right) = \sum_{i \in \mathcal{I}} \chi_s(G_i) + \min_{j \in \mathcal{I}} \left\{ \sum_{i \in \mathcal{I}, i \neq j} (|V_i| - \chi_s(G_i)) \right\}.$$

## The Binary Case

$$(G_1 * G_2) * G_3 = G_1 * (G_2 * G_3) = (G_1 * G_3) * G_2 = \dots$$

The join operation is commutative and associative

$\Rightarrow$  we will work with the **binary** case.

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## Lemma

Let  $G_1 = (V_1, E_1)$  and  $G_2 = (V_2, E_2)$  be graphs. Then

$$(i) \quad \chi_a(G_1 * G_2) = \chi_a(G_1) + \chi_a(G_2) + \min \{|V_1| - \chi_a(G_1), |V_2| - \chi_a(G_2)\};$$

# The Binary Case

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## Lemma

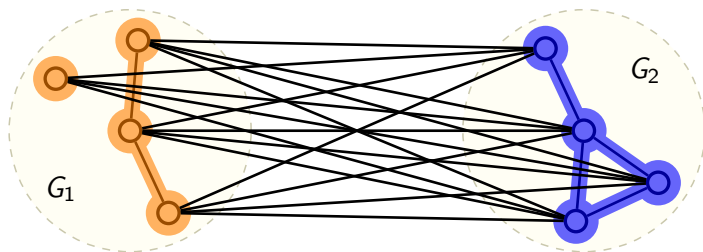
Let  $G_1 = (V_1, E_1)$  and  $G_2 = (V_2, E_2)$  be graphs. Then

- (i) 
$$\begin{aligned} \chi_a(G_1 * G_2) &= \chi_a(G_1) + \chi_a(G_2) \\ &\quad + \min \{ |V_1| - \chi_a(G_1), |V_2| - \chi_a(G_2) \}; \end{aligned}$$
- (ii) 
$$\begin{aligned} \chi_s(G_1 * G_2) &= \chi_s(G_1) + \chi_s(G_2) \\ &\quad + \min \{ |V_1| - \chi_s(G_1), |V_2| - \chi_s(G_2) \}. \end{aligned}$$

## Proof of Lemma

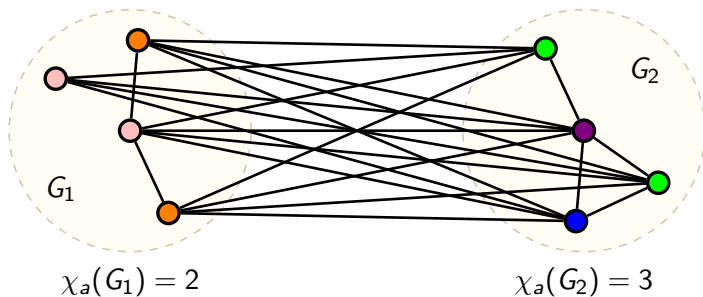
- ▶  $G_1$  and  $G_2$  are **induced subgraphs** of  $G_1 * G_2$ .
- ▶  $G_1$  and  $G_2$  cannot share any colors.

$$\chi_a(G_1 * G_2) \geq \chi_a(G_1) + \chi_a(G_2)$$



# Proof of Lemma

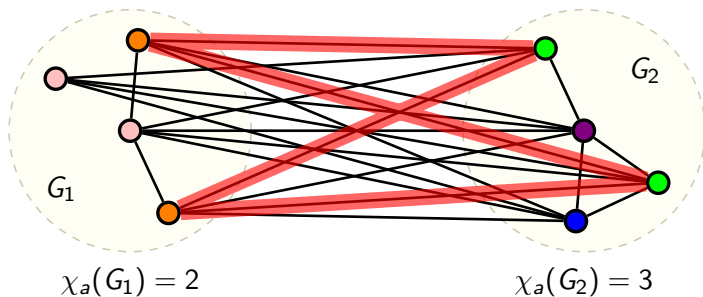
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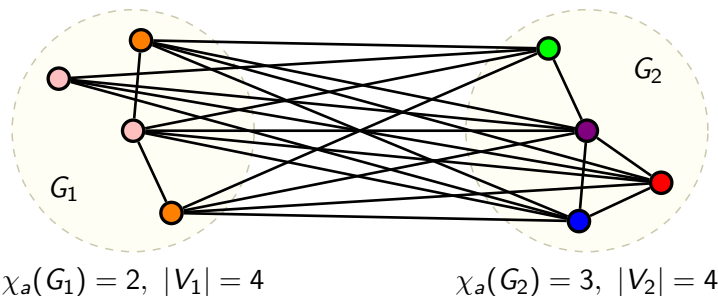
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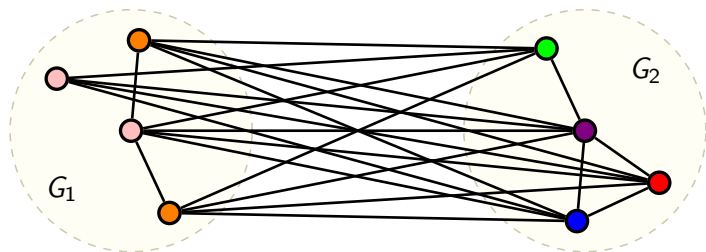
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$$\chi_s(G_1 * G_2) = \chi_s(G_1) + \chi_s(G_2) + \min \{|V_1| - \chi_s(G_1), |V_2| - \chi_s(G_2)\}$$



$$\chi_a(G_1) = 2, \quad |V_1| = 4$$

$$\chi_a(G_2) = 3, \quad |V_2| = 4$$

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# Cographs

## Forbidden subgraph characterization

A graph is a cograph if and only if it is  $P_4$ -free (does not contain  $P_4$  as an induced subgraph).

# Cographs

## Forbidden subgraph characterization

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## Restricted Coloring Characterization

A graph is a cograph if and only if every acyclic coloring is also a star coloring.

# Cographs

## Recursive Definition

A graph  $G$  is a cograph if and only if one of the following is true.

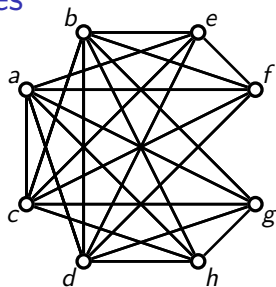
- (i)  $|V| = 1$ ;
- (ii) there exists a collection  $\{G_i\}_{i \in \mathcal{I}}$  of cographs such that

$$G = \bigcup_{i \in \mathcal{I}} G_i \quad (\text{disjoint union});$$

- (iii) there exists a collection  $\{G_i\}_{i \in \mathcal{I}}$  of cographs such that

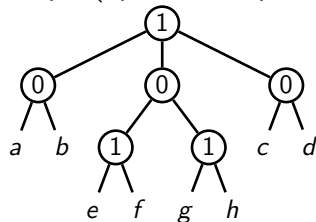
$$G = \bigotimes_{i \in \mathcal{I}} G_i \quad (\text{join}).$$

# Cographs and Cotrees



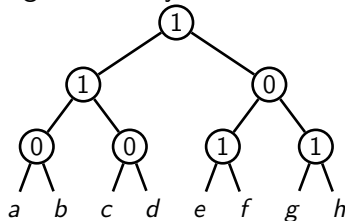
## Canonical cotree

Unique (up to isomorphism)



## Binary cotree

Algorithmically convenient



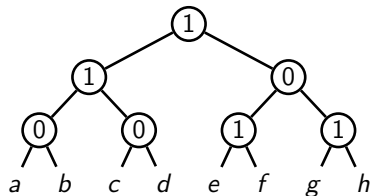


# Acyclic and Star Coloring Cographs

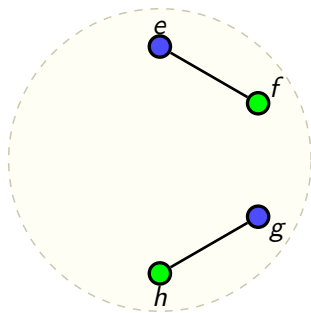
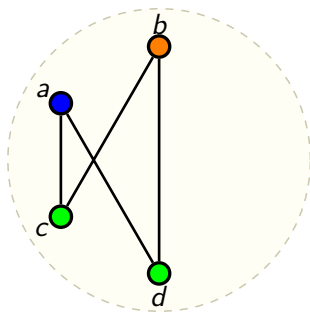
## Theorem

*An optimal acyclic coloring of a cograph can be found in linear time.  
Furthermore, the obtained coloring is also an optimal star coloring.*

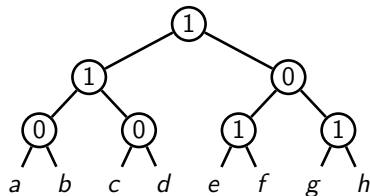
## Example



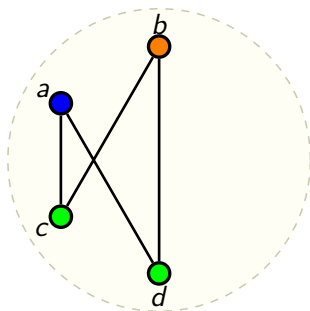
$$\chi_a(G_1 * G_2) = \chi_a(G_1) + \chi_a(G_2) + \min \{ |V_1| - \chi_a(G_1), |V_2| - \chi_a(G_2) \}$$



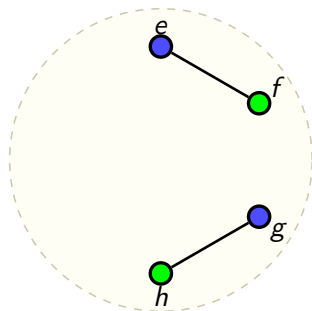
## Example



$$\chi_a(G_1 * G_2) = \chi_a(G_1) + \chi_a(G_2) + \min \{|V_1| - \chi_a(G_1), |V_2| - \chi_a(G_2)\}$$

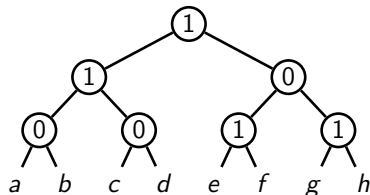


$$|V_1| = 4, \chi_a(G_1) = 3$$

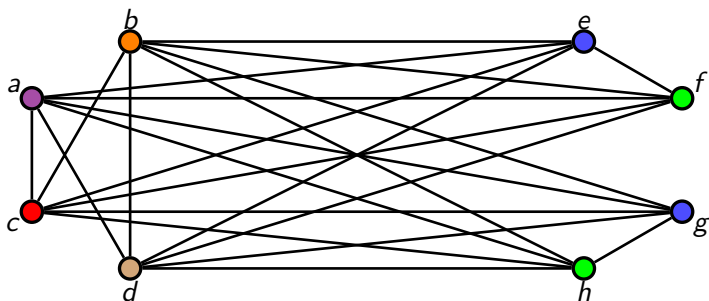


$$|V_2| = 4, \chi_a(G_2) = 2$$

## Example



$$\begin{aligned}\chi_a(G_1 * G_2) &= \chi_a(G_1) + \chi_a(G_2) + \min \{|V_1| - \chi_a(G_1), |V_2| - \chi_a(G_2)\} \\ &= 3 + 2 + \min \{4 - 3, 4 - 2\} \\ &= 6\end{aligned}$$



$$|V_1| = 4, \chi_a(G_1) = 3$$

$$|V_2| = 4, \chi_a(G_2) = 2$$

# Outline

## Restricted Coloring Problems

- Acyclic coloring

- Star Coloring

## Applications to Hessian Computation

- Star Coloring – Direct Hessian Computation

- Acyclic Coloring – Indirect Hessian Computation

## Acyclic and Star Coloring Joins of Graphs

- The Join Operation  $*$

- Main Theorem

- The Binary Case

## Cographs

- Definitions and Characterizations

- Algorithms for Acyclic and Star Coloring

- Example

## Future Work

# Future Work

## Extension to other graph classes

**Tree-cographs** Same operations as cographs, but start with **trees** rather than single isolated vertices

**$P_4$ -sparse** No set of five vertices induces more than one  $P_4$ .  
(Generalize by adding a third composition operation.)

**$P_4$ -lite** ...

**$P_4$ -extendible** ...

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## Other Decompositions

Modular

Split

Clique

Tree

...

Thank You!

Questions?